

Improving LIQSS1

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Improving a Linearly Implicit Quantized State System Method

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Lumped parameter models coming from mechanics, electromagnetism, chemistry, thermodynamics, hydraulics, etc. are usually represented by sets of **Ordinary Differential Equations** of the form:

$$\begin{aligned}\dot{x}_1(t) &= f_1(x_1(t), \dots, x_n(t), t) \\ \dot{x}_2(t) &= f_2(x_1(t), \dots, x_n(t), t) \\ &\vdots \\ \dot{x}_n(t) &= f_n(x_1(t), \dots, x_n(t), t)\end{aligned}\tag{1}$$

where t represents time, $x_i(t)$ are the **state variables** and $\dot{x}_i(t)$ represents $x_i(t)$ first time derivative.

The system represented by Eq.(1) can be written in a compact manner by using vector notation:

$$\dot{\mathbf{x}}(t) = \mathbf{f}(\mathbf{x}(t), t) \quad (2)$$

where

$$\mathbf{x}(t) \triangleq [x_1(t), x_2(t), \dots, x_n(t)]^T$$

is the **states vector**, for which initial conditions are usually known

$$\mathbf{x}(t_0) = \mathbf{x}_0 \quad (3)$$

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In order to **simulate** system of Eq.(2), the equation must be solved from the initial condition \mathbf{x}_0 .

In general, analytically solving Eq.(2) is impossible.

For that reason, **Numerical Integration Methods** of ODEs are used, which attempt to provide an approximated solution.

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Given the system

$$\dot{\mathbf{x}}(t) = \mathbf{f}(\mathbf{x}(t), t)$$

with initial conditions $\mathbf{x}(t_0) = \mathbf{x}_0$, the aim of numerical integration methods is to obtain an approximated solution for times t_1, t_2, \dots, t_N .

$$\tilde{\mathbf{x}}_1 \approx \mathbf{x}(t_1), \tilde{\mathbf{x}}_2 \approx \mathbf{x}(t_2), \dots, \tilde{\mathbf{x}}_N \approx \mathbf{x}(t_N),$$

The difference $h_k \triangleq t_{k+1} - t_k$ is called **integration step** and may be constant or variable.

Single-step methods

These methods compute \mathbf{x}_{k+1} just by using information about \mathbf{x}_k . (**Runge-Kutta** methods)

Multi-step methods

These methods compute \mathbf{x}_{k+1} by using information about \mathbf{x}_k and some other previous instants (\mathbf{x}_{k-1} , etc).

Implicit methods

Implicit methods (single of multi-step) use **future** information to compute \mathbf{x}_{k+1} , so an equation is required to be solved in every step.

- they present advantages as regards to numerical stability
- their implementation require **iterative algorithms**

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These systems simultaneously present **slow** and **fast dynamics**.

At first, a small step should be used, and then enlarge it as fast dynamics fades away.

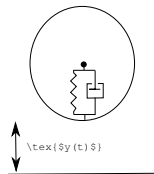
Problem: explicit methods became **numerically unstable** when step **h** is enlarged.

Hence, when dealing with stiff systems, the use of **implicit algorithms** with step control is mandatory.

The model of a simple ball falling and bouncing on the floor is the following:

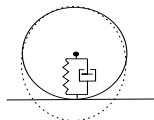
$$\dot{y}(t) = v(t)$$

$$\dot{v}(t) = \begin{cases} -g & \text{if } y(t) > 0 \\ -g - \frac{k}{m} \cdot y(t) - \frac{b}{m} \cdot v(t) & \text{if } y(t) \leq 0 \end{cases}$$



This ODE has a **discontinuity** in $y = 0$.

Integration methods might produce unacceptable errors. **Detection** of instants in which $y(t) = 0$ is necessary, and from that point, the simulation must restart.



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There are diverse systems in which classic integration methods result inefficient, among them:

- Systems with very frequent **discontinuities** (typical in **Power Electronics**).
- **Large scale stiff** systems (e.g. Advection–Diffusion–Reaction equation semi-discretized with the Method of Lines).

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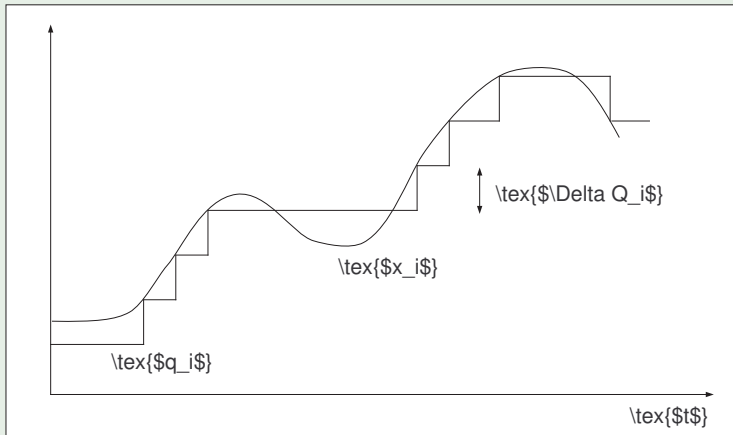
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Quantification function with hysteresis



Definition

Given the system

$$\dot{\mathbf{x}}(t) = \mathbf{f}(\mathbf{x}(t), t)$$

the QSS1 approximation is given by

$$\dot{\mathbf{x}}(t) = \mathbf{f}(\mathbf{q}(t), t)$$

where $\mathbf{q}(t)$ and $\mathbf{x}(t)$ are componentwise linked by hysteresis quantification functions.

- $\mathbf{q}(t)$ is the quantized states vector.
- Each quantification function is determined by a parameter ΔQ_i called **Quantum**.

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Advantages

- Good stability and error bounding.
- Great advantages when simulating discontinuous systems.

Disadvantages

- Appearance of oscillations. Troubles with **stiff systems**.
- **Number of steps grow linearly with precision.**

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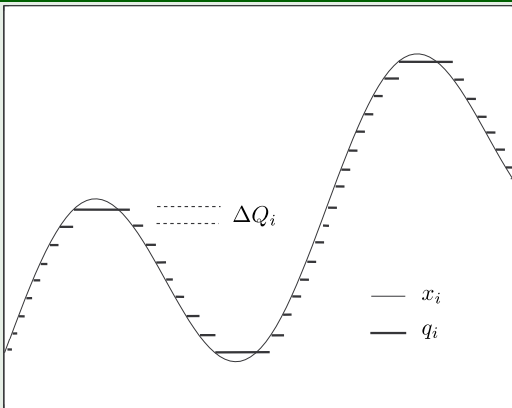
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Zero order quantification



- **First order** method.
- Number of steps grows linearly with precision.

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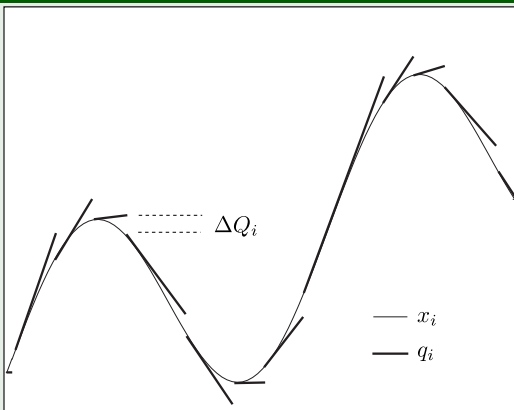
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First order quantification



- Same properties and advantages as QSS1.
- **Second order** method.
- Number of steps grows with the square root of precision.

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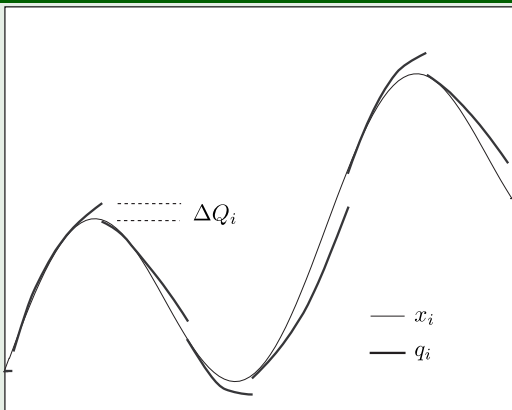
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Second order quantification



- Same properties and advantages as QSS1.
- **Third order** method.
- Number of steps grows with the cube root of precision.

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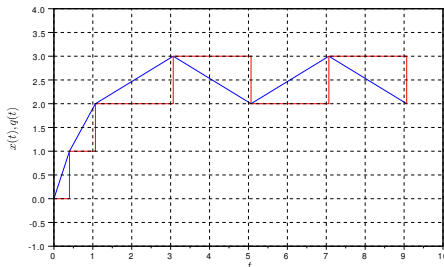
Consider

$$\dot{x}(t) = 2,5 - x(t)$$

and its QSS1
approximation

$$\dot{x}(t) = 2,5 - q(t)$$

with $\Delta Q = 1$ y
 $x(0) = 0$.



- Usually, QSS solutions end with **oscillations** around the equilibrium.
- This leads to some issues in **stiff systems**.

Classic methods suitable for stiff systems are based on **future** values of the state to compute their derivatives (implicit methods).

- In QSS methods, $q_i(t)$ is always a **past** value of $x_i(t)$.
- The idea in LIQSS is that $q_i(t)$ takes a **future** state value.

Since we always know the future value in the next step ($x_i(t) \pm \Delta Q_i$), the problem results to be **explicit**.

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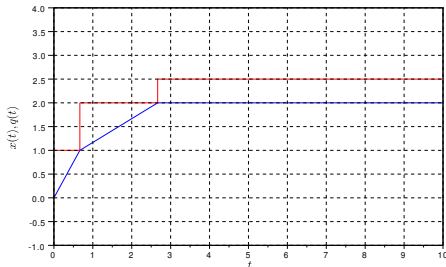
Consider the equation

$$\dot{x}(t) = 2,5 - x(t)$$

and its LIQSS1 approximation

$$\dot{x}(t) = 2,5 - q(t)$$

with $\Delta Q = 1$ y
 $x(0) = 0$.



In this case, final oscillations no longer exist.

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- There are LIQSS methods of order 1 to 3.
- These methods efficiently integrate **stiff systems** where the stiffness is due to large entries in the main diagonal of the Jacobian matrix.

Consider now

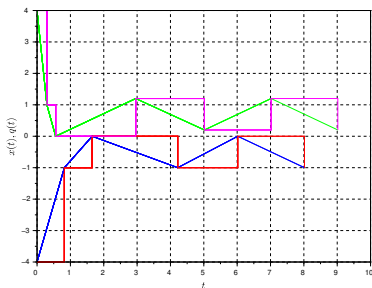
$$\dot{x}_1 = -x_1 - x_2 + 0,2$$

$$\dot{x}_2 = x_1 - x_2 + 1,2$$

with $\Delta Q = 1$,

$$x_1(0) = -4 \text{ and}$$

$$x_2(0) = 4.$$



In this case **oscillations** appear due to the interaction of state variables x_1 and x_2 .

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Consider now

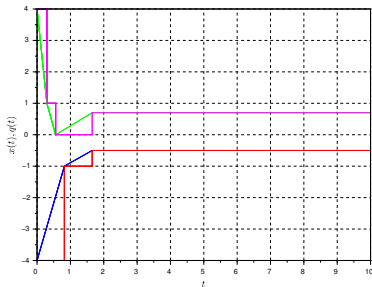
$$\dot{x}_1 = -x_1 - x_2 + 0,2$$

$$\dot{x}_2 = x_1 - x_2 + 1,2$$

with $\Delta Q = 1$,

$$x_1(0) = -4 \text{ and}$$

$$x_2(0) = 4.$$



Now **oscillations** due to the interaction of state variables x_1 and x_2 no longer exist.

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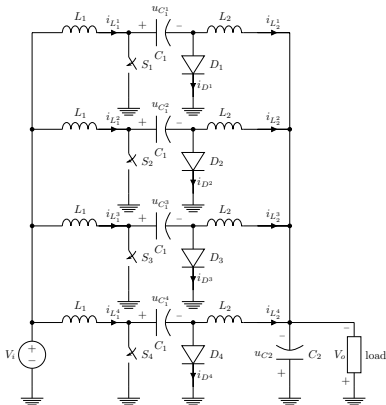
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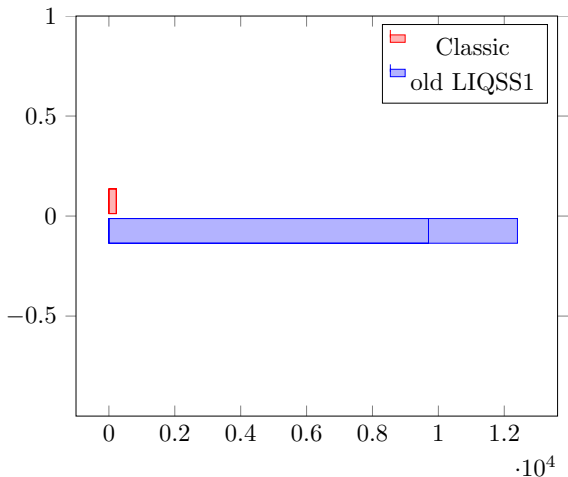
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CPU time comparisons for different error tolerances



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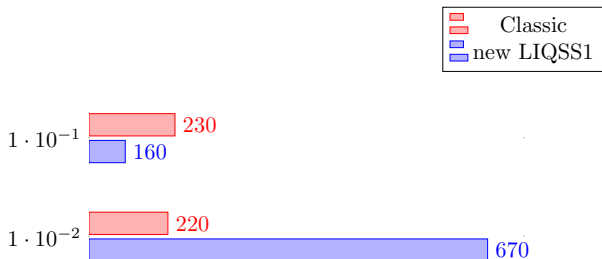
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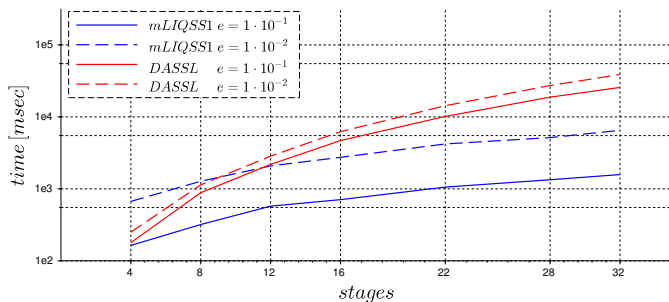
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A modification to the LIQSS1 Method was proposed.

- Allows to efficiently simulate stiff systems with more general structures than before.
- Implemented in the QSS standalone solver.
<https://sourceforge.net/projects/qssengine/>
- It is the first theoretical step to develop higher order improved LIQSS methods.
- It is also the first approach to effectively combine QSS and classic discrete time ODE solvers.

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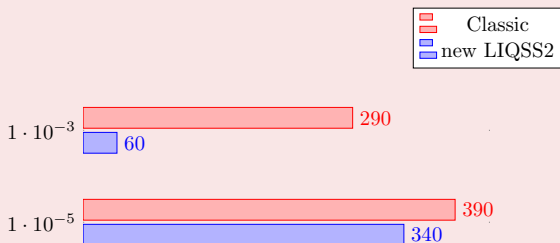
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- Extending the idea for higher orders methods.

CPU time comparisons for different error tolerances



- Study these methods in a wider variety of applications.

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